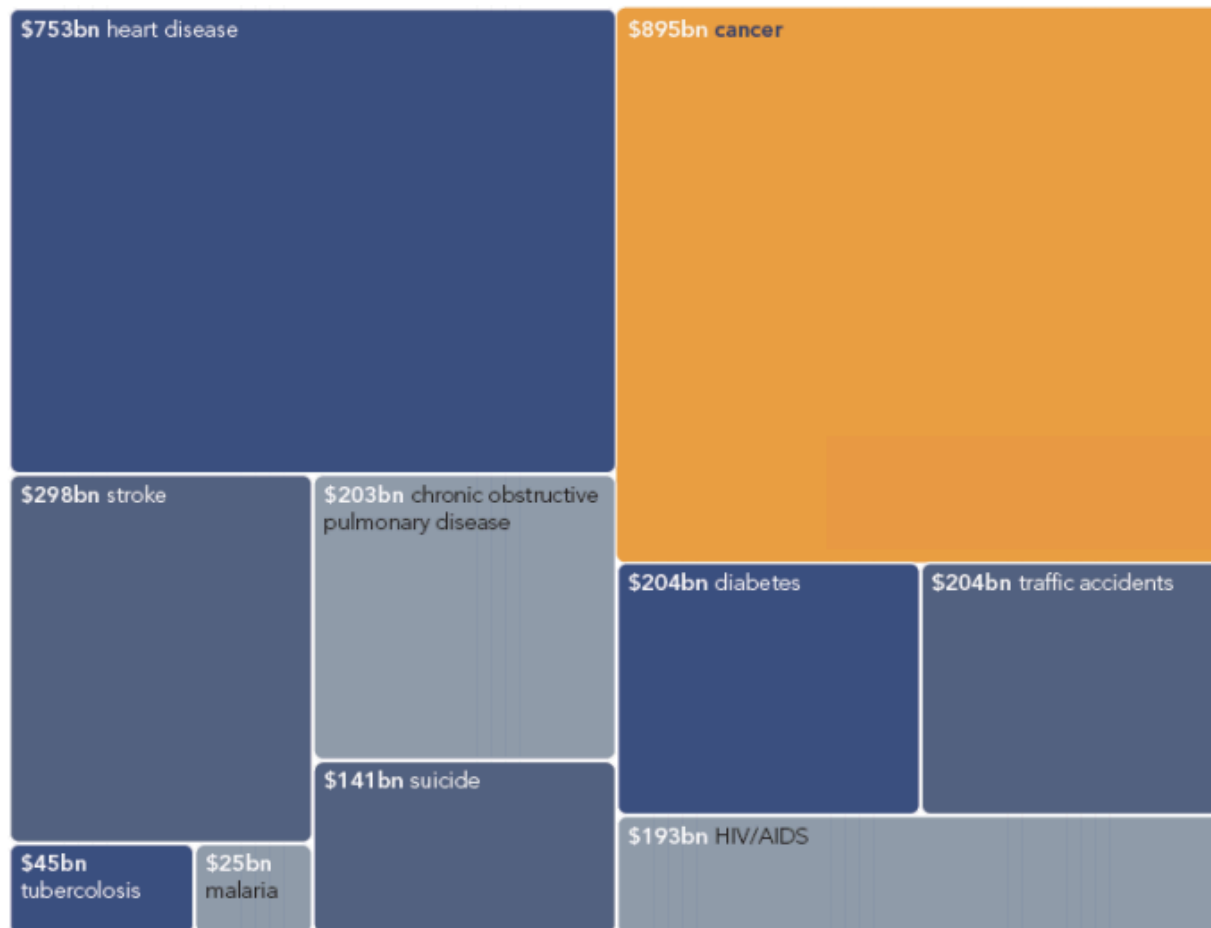


Cancer Genomes

02-710 Computational Genomics

The Economic Burden of Cancer

- The economic cost of cancer exceeds that of any other disease



The Cancer Genome Atlas

CANCER TISSUES COLLECTED FOR STUDY

Last Updated: March 04, 2016

[Expand All](#) | [Collapse All](#)

▶ Breast

▶ Central Nervous System

▶ Endocrine

▶ Gastrointestinal

▶ Gynecologic

▶ Head and Neck

▶ Hematologic

▶ Skin

▶ Soft Tissue

▶ Thoracic

▶ Urologic

▼ Breast

Cancer Type	Sample Collection Complete	Data Publicly Available
Breast Ductal Carcinoma	✓	✓
Breast Lobular Carcinoma	✓	✓

▼ Central Nervous System

Cancer Type	Sample Collection Complete	Data Publicly Available
Glioblastoma Multiforme	✓	✓
Lower Grade Glioma	✓	✓

▼ Endocrine

Cancer Type
Adrenocortical Carcinoma
Papillary Thyroid Carcinoma
Paraganglioma & Pheochromocytoma

- Tumor gene expressions
- Tumor microRNA expression
- epigenetic data
- clinical data
- Tumor sequence data

▼ Gastrointestinal

Overview

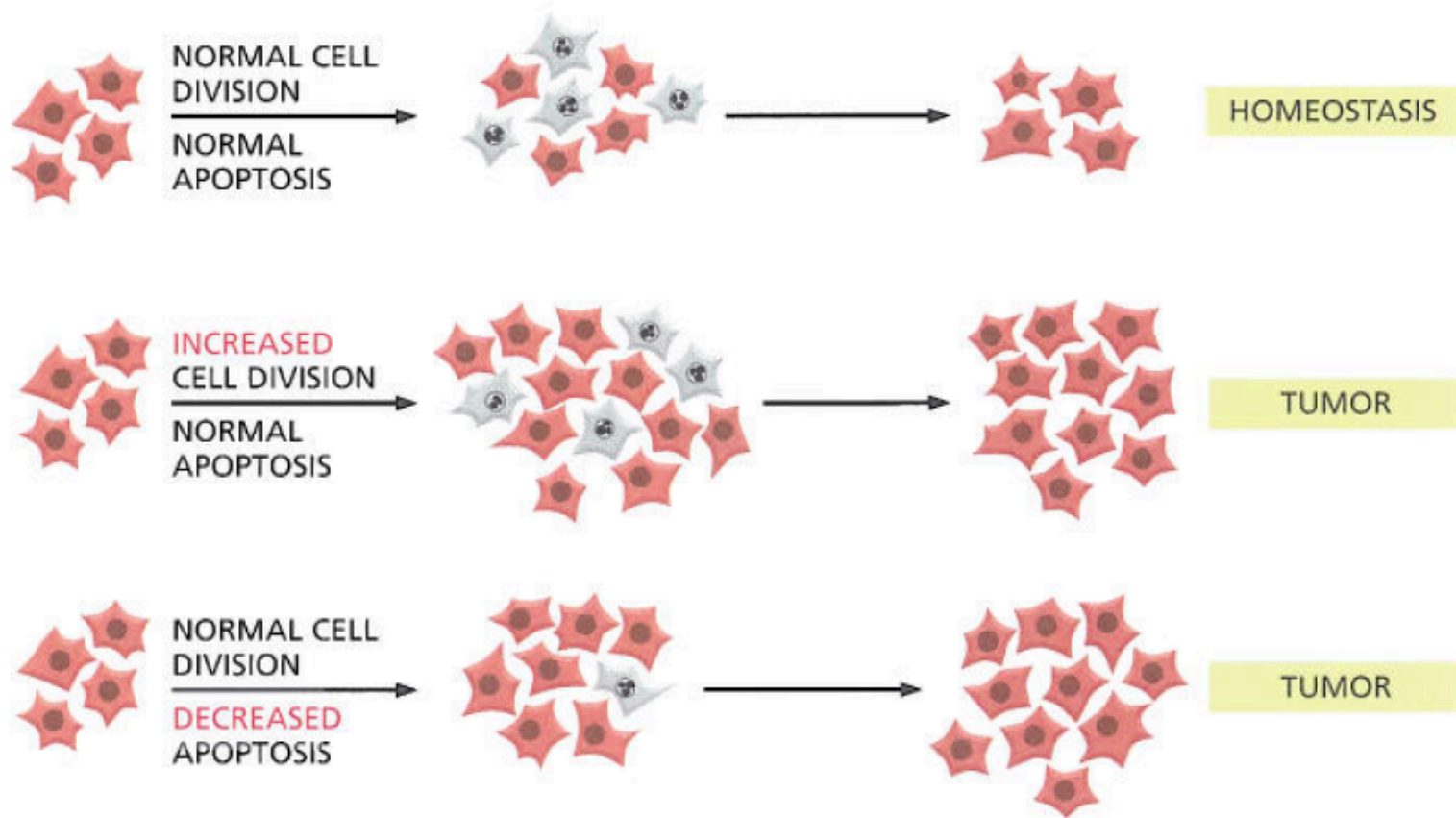
- What is cancer and how does it develop?
- Genetics of cancer
- Cancer subtypes and personalized medicine
- Tumor heterogeneity

Development of Cancer Cells

- Types of cancers
 - Carcinomas: cancers arising from epithelial cells
 - Sarcomas: cancers arising from connective tissue or muscle cells
 - Leukemias and lymphomas: cancers derived from white blood cells and their precursors
- Agents that trigger carcinogenesis
 - Chemical carcinogens (causes local DNA alterations)
 - Radiation such as x-rays (causes chromosome breaks and translocations), UV light (causes DNA base alterations)
 - Viruses: Hepatitis-B, Hepatitis-C virus for liver cancer

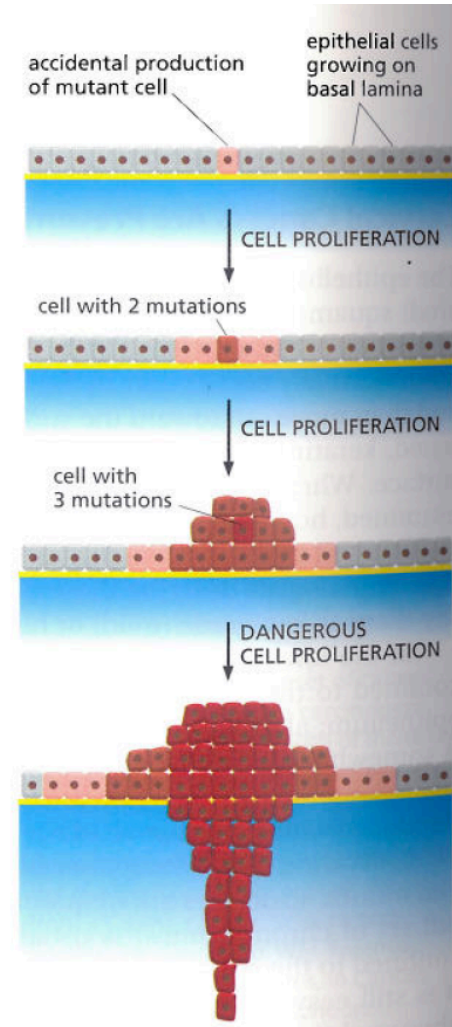
Defective Control of Cell Death and Differentiation in Cancer Cells

- Both **increased cell division** and **decreased apoptosis** (cell death) can contribute to tumorigenesis



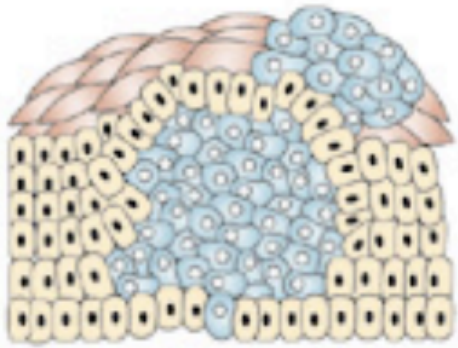
Tumors

- Cancer cells
 - Reproduce in defiance of the normal restraints on cell growth and division
 - Invade and colonize territories normally reserved for other cells

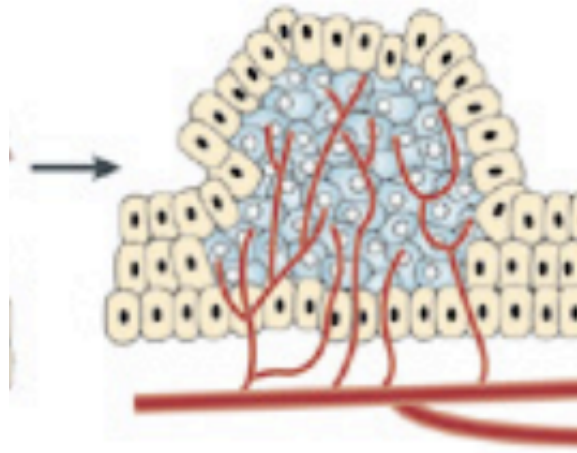


Cancer Progression

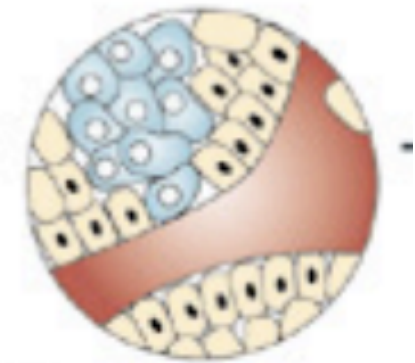
a Primary tumour



b Proliferation/
angiogenesis



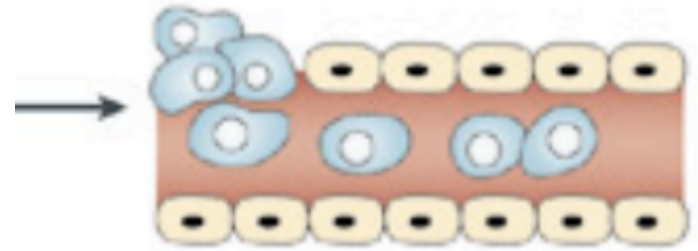
c Detachment/
invasion



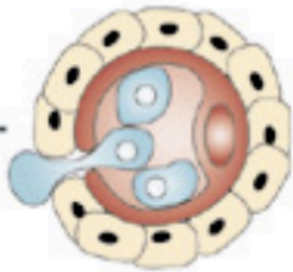
Lymphatics,
venules,
capillaries

Cancer Progression

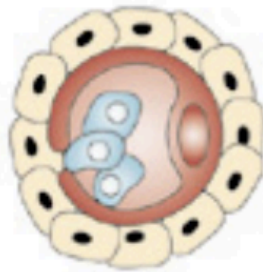
d Embolism/circulation



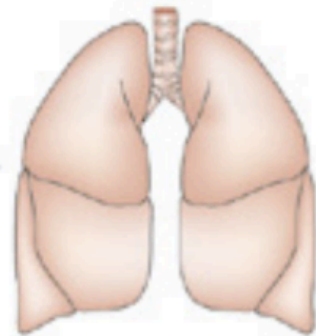
e Extravasation



Adherence to vessel wall



Arrest in organs



Lung

Transport



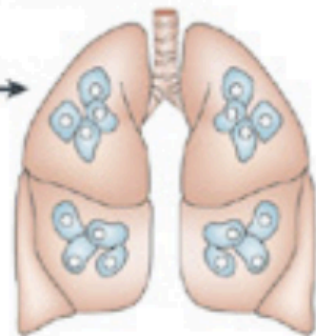
Heart

Establishment of a microenvironment

f

Proliferation/angiogenesis

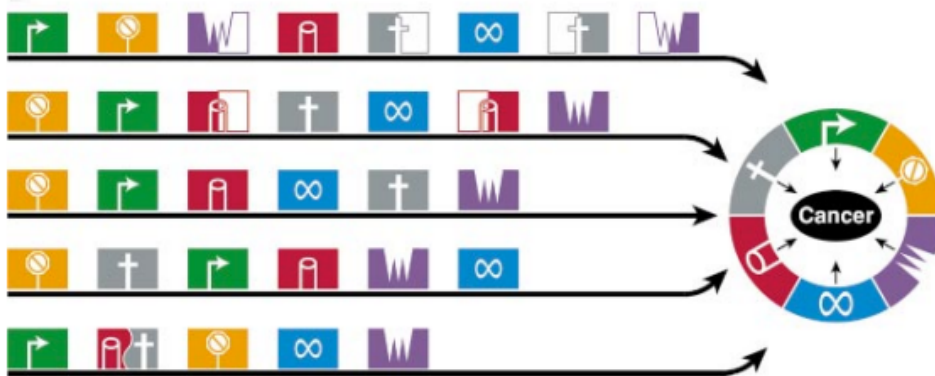
Metastasis









Overview

- What is cancer how does it develop?
- Genetics of cancer
- Cancer subtypes and personalized medicine
- Tumor heterogeneity

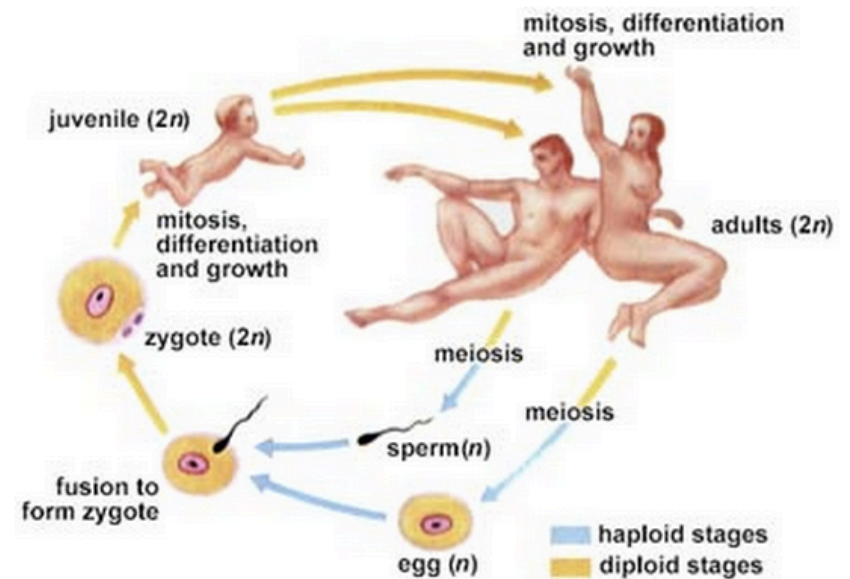
Pathways of Tumorigenesis



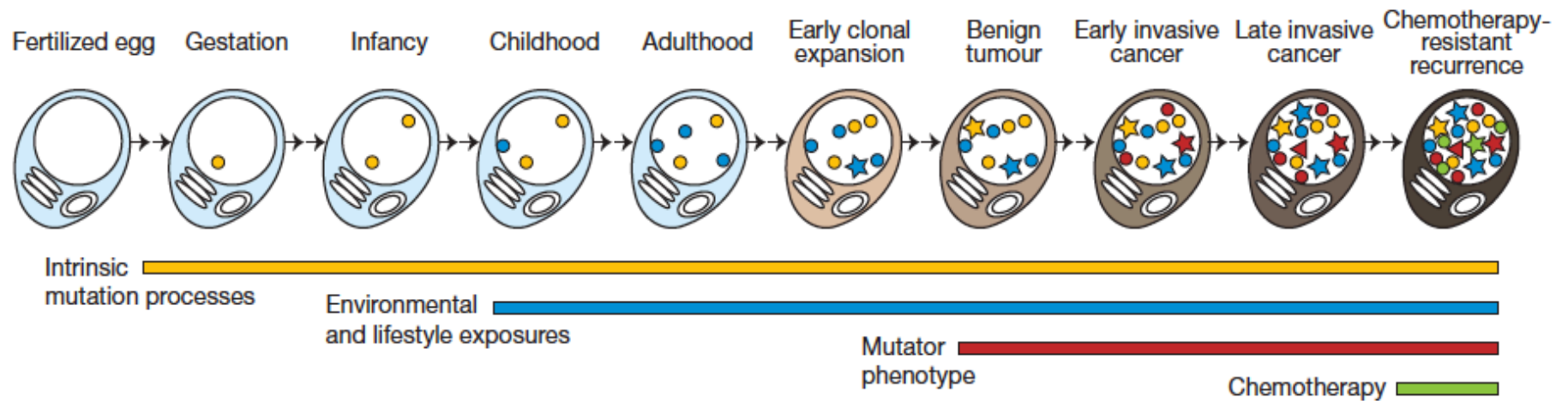
Component	Acquired Capability	Example of Mechanism
	Self-sufficiency in growth signals	Activate H-Ras oncogene
	Insensitivity to anti-growth signals	Lose retinoblastoma suppressor
	Evading apoptosis	Produce IGF survival factors
	Limitless replicative potential	Turn on telomerase
	Sustained angiogenesis	Produce VEGF inducer
	Tissue invasion & metastasis	Inactivate E-cadherin

Germline vs Somatic Mutations

- Germline mutations
 - Any detectable and heritable variation in the lineage of germ cells
 - Mutations in these cells are transmitted to offspring
 - So far, we focused on germline mutations for complex diseases
- Somatic mutations
 - Mutations in non germline cells
 - These mutations are not transmitted to offsprings
- Cancer can be caused by both **germline and somatic mutations**



Cancer Progression

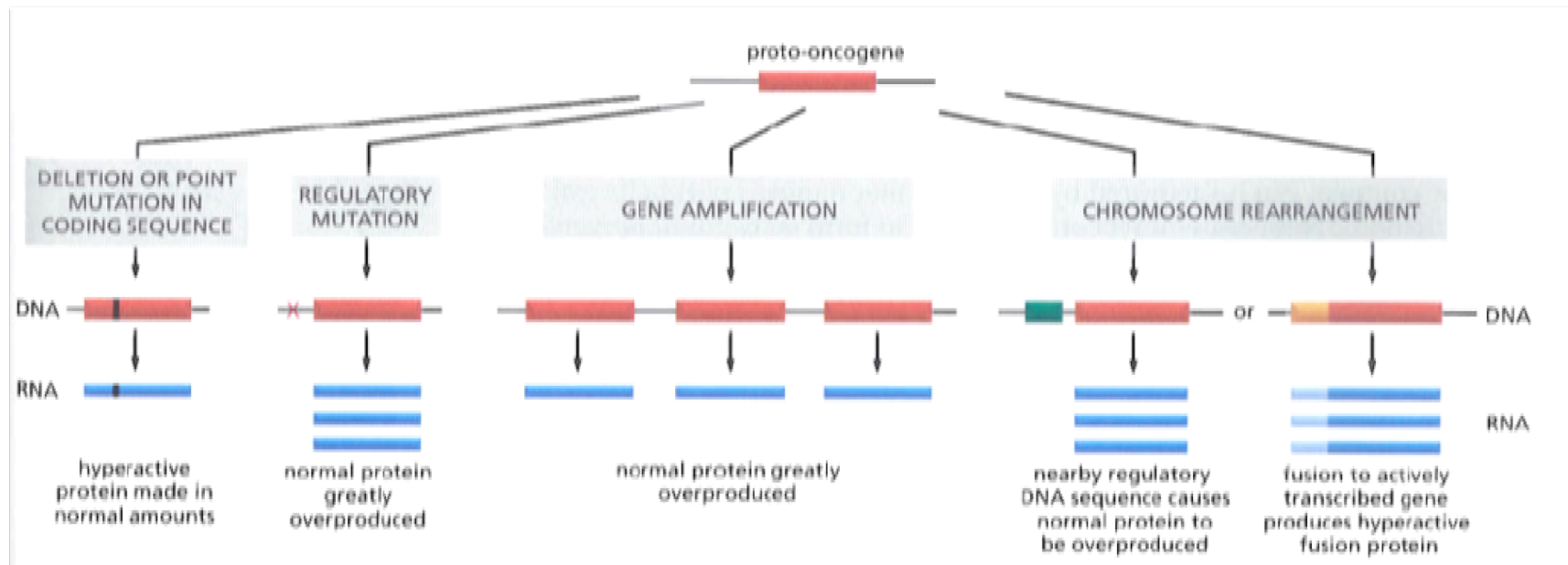


Mutations can be on **genomes or epigenomes**

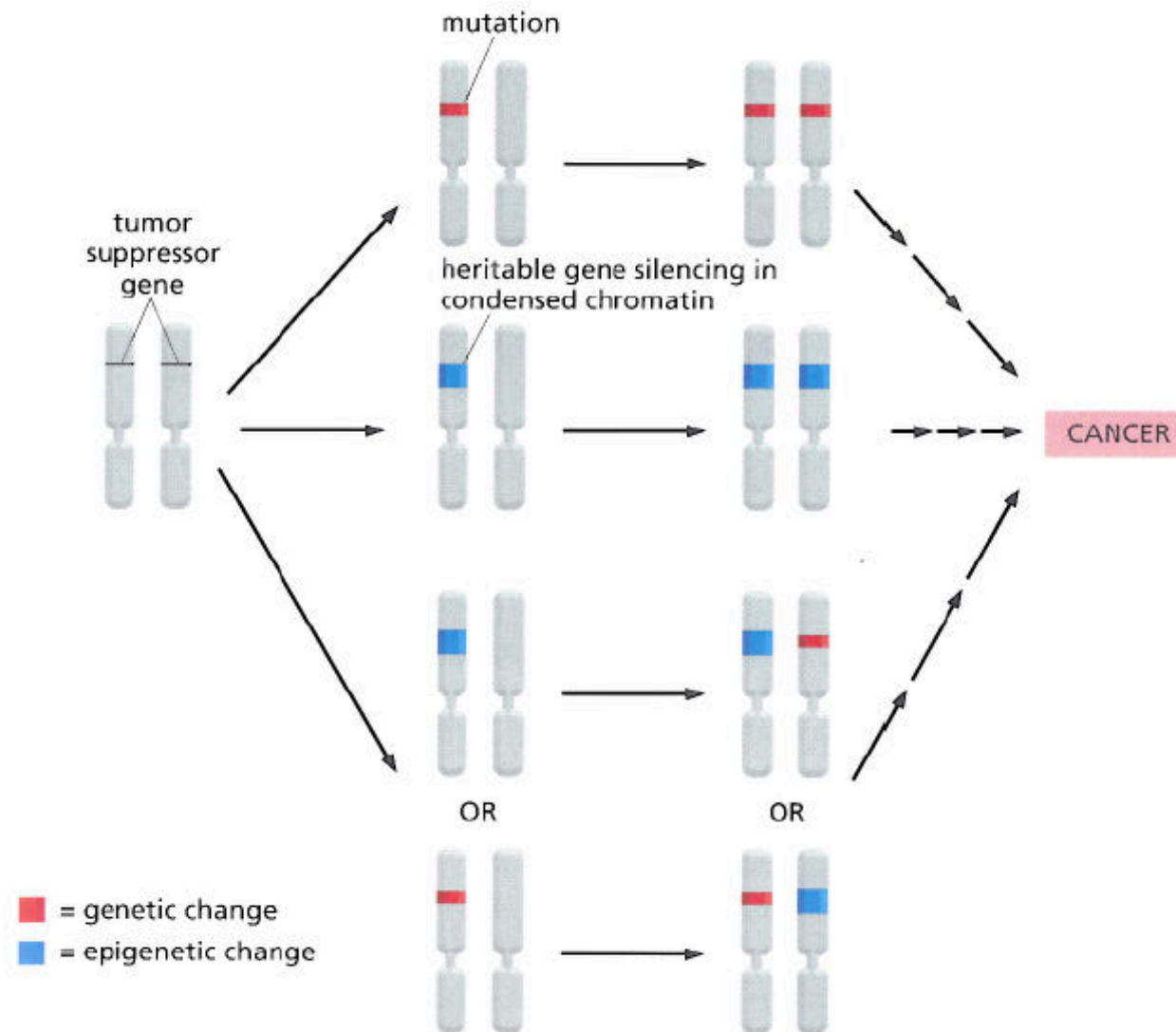
Cancer-Causing Genes

- Oncogenes
 - Mutations that confer gain of functions to oncogenes can promote cancer
 - Mutations with growth-promoting effects on the cell
 - Often heterozygous mutation is enough to make cells cancerous. Why?
- Tumor suppressor genes
 - Mutations that confer loss of function to tumor suppressor genes can contribute to cancer
 - Typically homozygous mutation is required to make cells cancerous. Why?
- DNA maintenance genes
 - Indirect effects on cancer development

Mutations in Oncogenes



Mutations in Tumor Suppressor Genes



How to Find Cancer Causing Mutations

- Germline cancer mutations?
 - Genotype data are collected for a large number of normals and cancer patients (case/control studies)
- Somatic cancer mutations?
 - Genotype data are collected for **blood (normal) and cancer cells** for each cancer patient, for a large number of cancer patients.
 - **What is the challenge?**

Driver and Passenger Mutations

- **Driver mutations**
 - Causally implicated in oncogenesis
 - Gives growth advantage to cancer cells
 - E.g., mutations that de-activate tumor suppressor genes
 - positively selected in the microenvironment of the tissue
- **Passenger mutations**
 - Somatic mutations with no functional consequences
 - Does not give growth advantage to cancer cells
 - However, the passenger mutations are propagated to daughter cells just because they co-exist with the driver mutation in the same cell
- **Key Scientific Question: How can we distinguish between driver and passenger mutations?**

Identifying Driver Mutations

- Compare the tumor genome with the **normal genome** of the same individual
- Compare the tumor genome with **reference genome**
- Other known DNA polymorphisms
- Signatures of driver mutations
 - Frequently observed mutations across tumors
 - Mutations that characterize cancer subtypes
 - Mutations that cluster in subset of genes
 - Passenger mutations are more randomly distributed across genomes

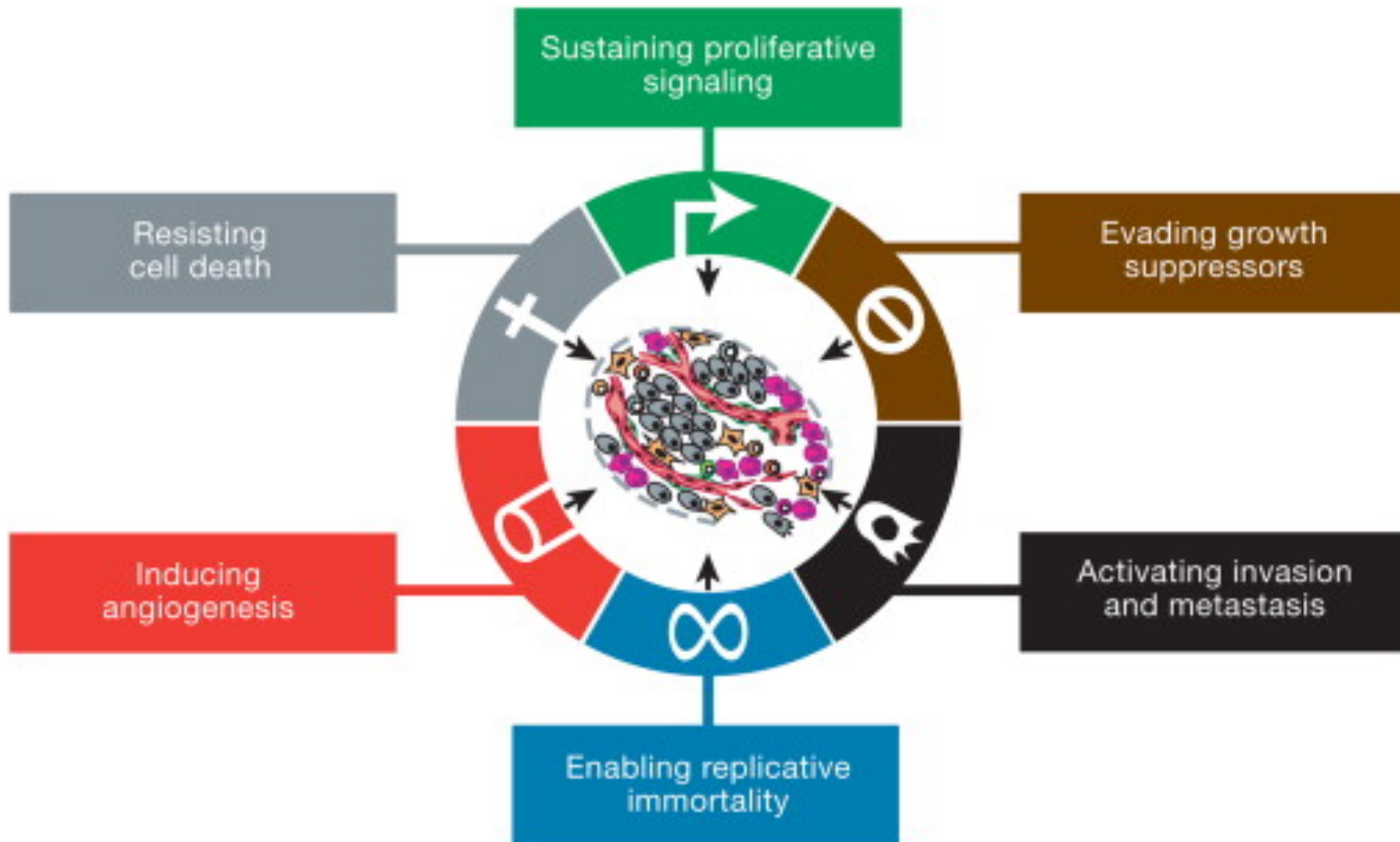
Methods for Detecting Driver Mutations

- SIFT
 - A tool that predicts whether an amino acid substitution affects protein function
 - Classifies a substitution into tolerated or deleterious ones
- PolyPhen
 - Software for predicting damaging effects of nonsynonymous mutations

Overview

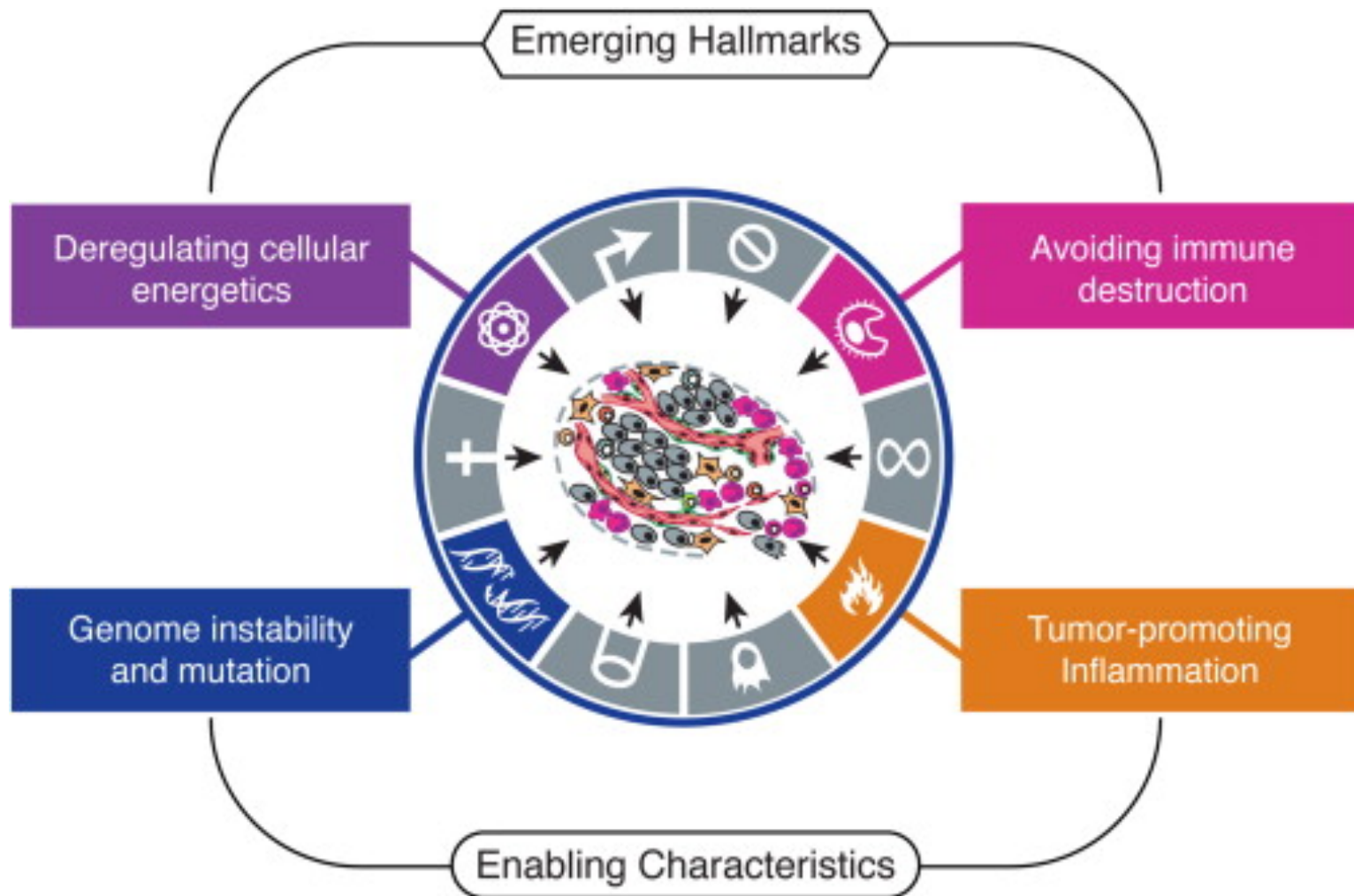
- What is cancer how does it develop?
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Why Do Cancers Sort Into Subtypes?



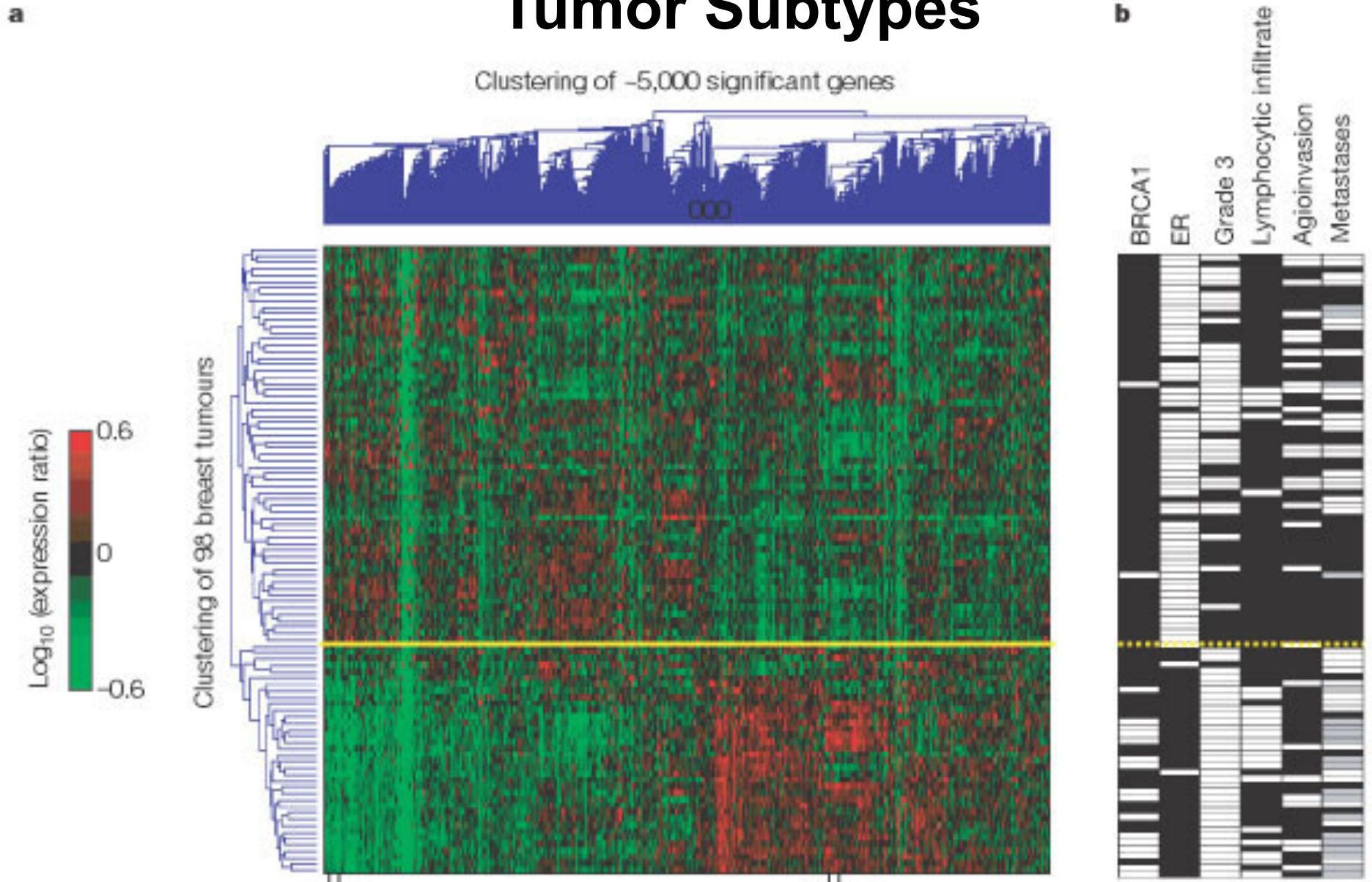
From: Hanahan and Weinberg, "Hallmarks of Cancer: The Next Generation." *Cell* 144(5):646-674, 2011.

Why Do Cancers Sort Into Subtypes?



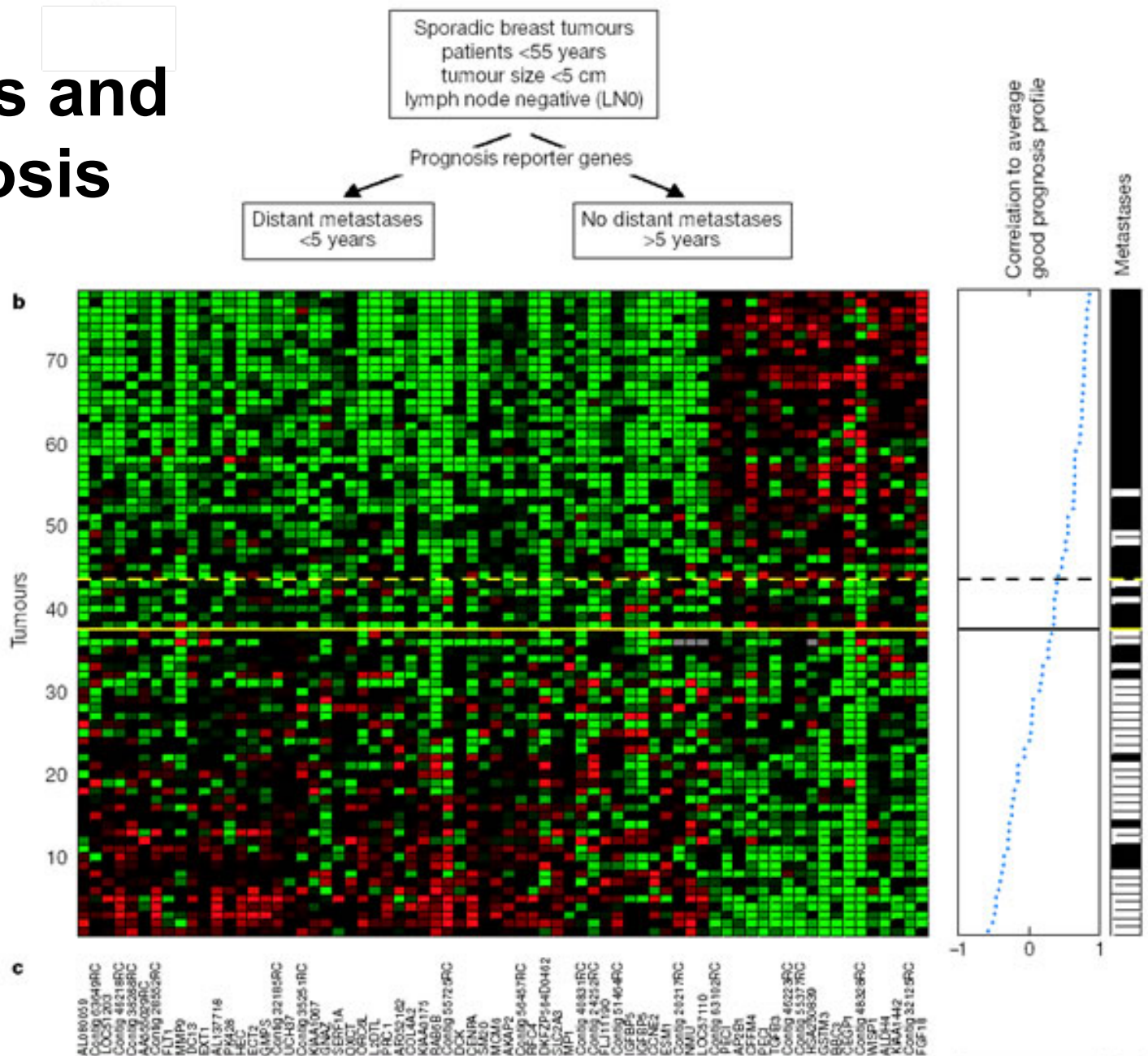
From: Hanahan and Weinberg, "Hallmarks of Cancer: The Next Generation." *Cell* 144(5):646-674, 2011.

Tumor Subtypes



From: van't Veer et al., "Gene expression profiling predicts clinical outcome of breast cancer."
Nature 415:530-536, 2001.

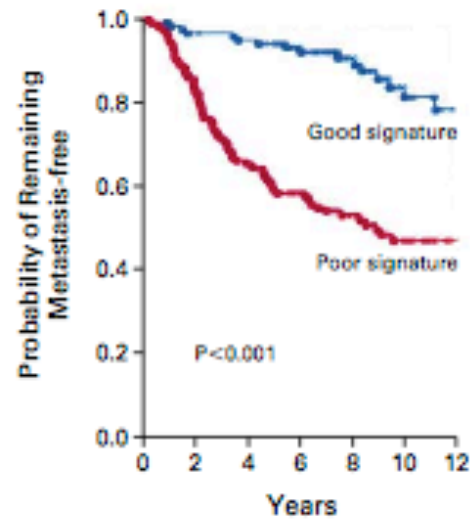
Subtypes and Prognosis



From van't Veer et al., "Gene expression profiling predicts clinical outcome of breast cancer." Nature 415:530-536, 2001.

Genomic Diagnostics

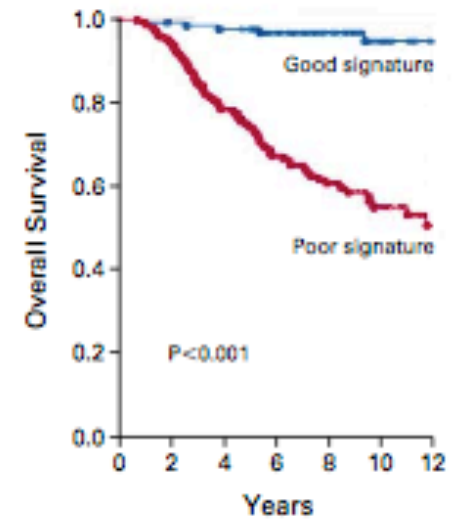
A All Patients



No. AT Risk

Good signature	115	111	107	87	59	38	19
Poor signature	180	146	111	84	52	33	17

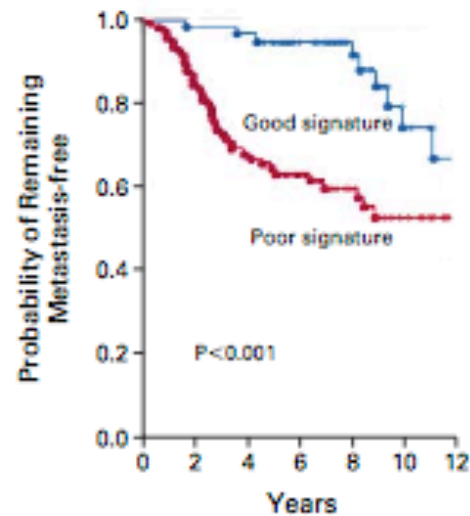
B All Patients



No. AT Risk

Low risk	115	114	112	91	65	43	23
High risk	180	167	134	100	62	40	19

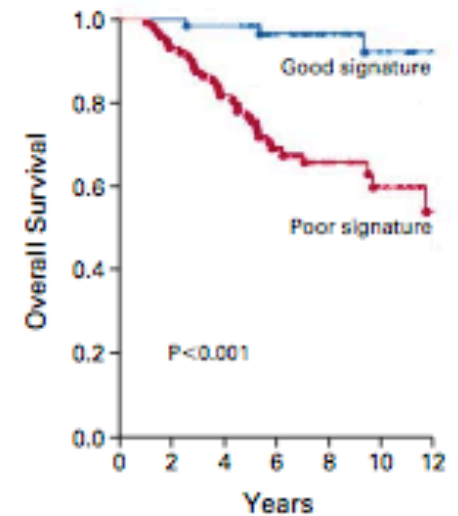
E Lymph-Node-Positive Patients



No. AT Risk

Good signature	55	54	53	42	28	14	7
Poor signature	89	74	56	43	26	16	8

F Lymph-Node-Positive Patients

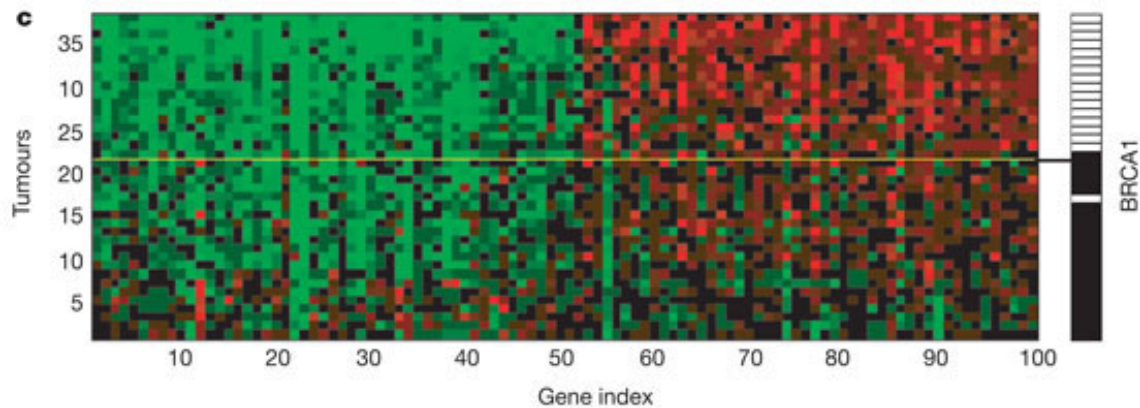
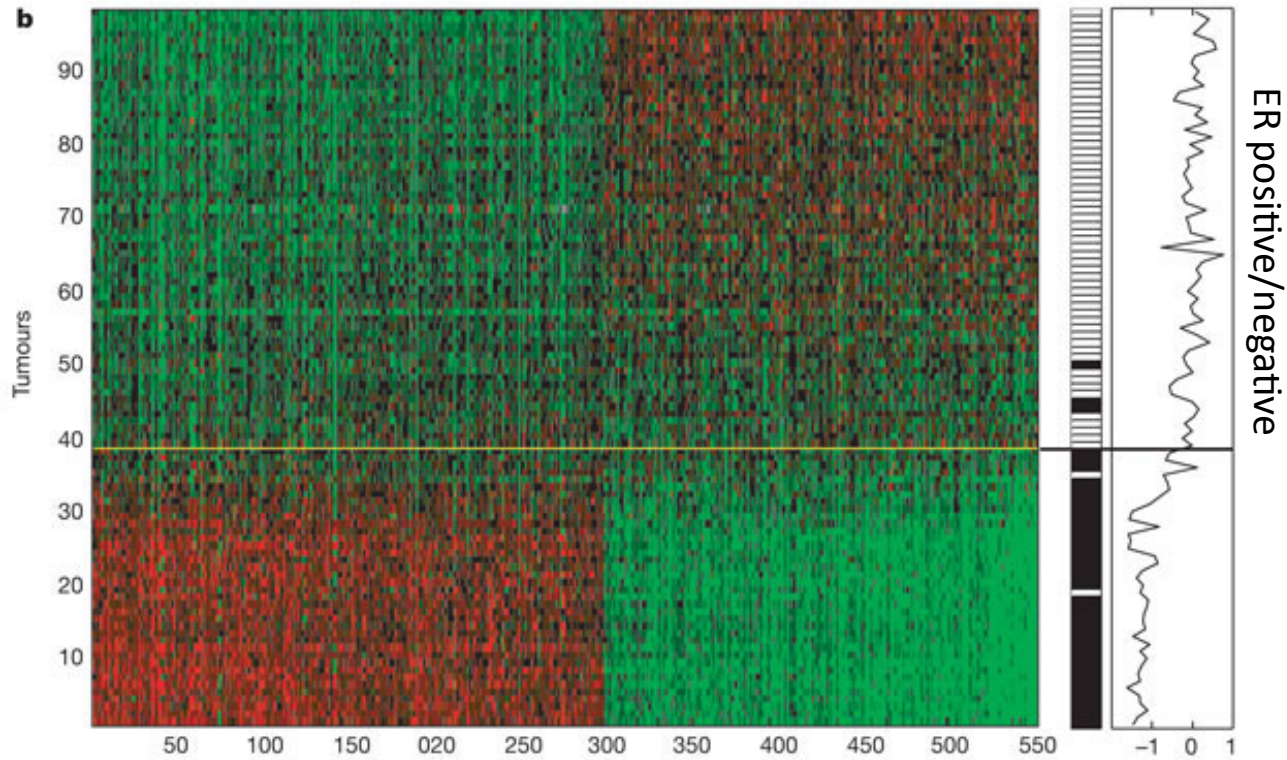


No. AT Risk

Good signature	55	55	54	43	30	19	11
Poor signature	89	81	68	50	29	19	9

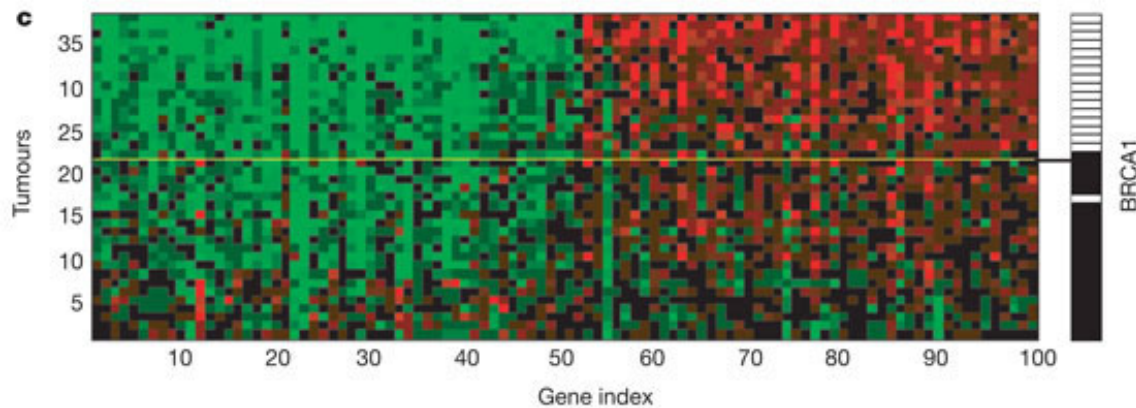
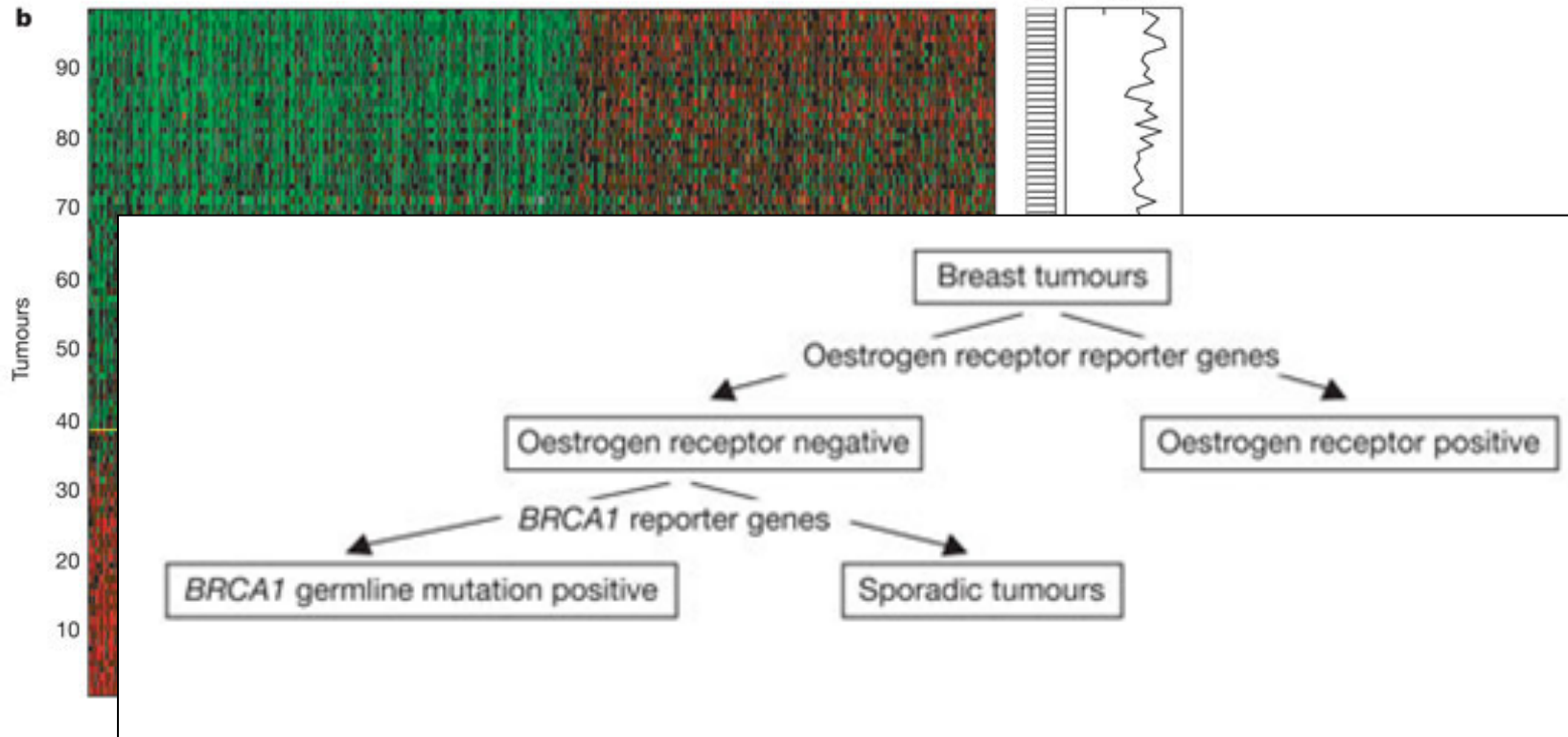
From: van de Vijver et al. "A Gene-Expression Signature as a Predictor of Survival in Breast Cancer." New England Journal of Medicine. 347:1999-2009, 2002.

Expression Subtype Reflects the Genetic Basis of the Tumor



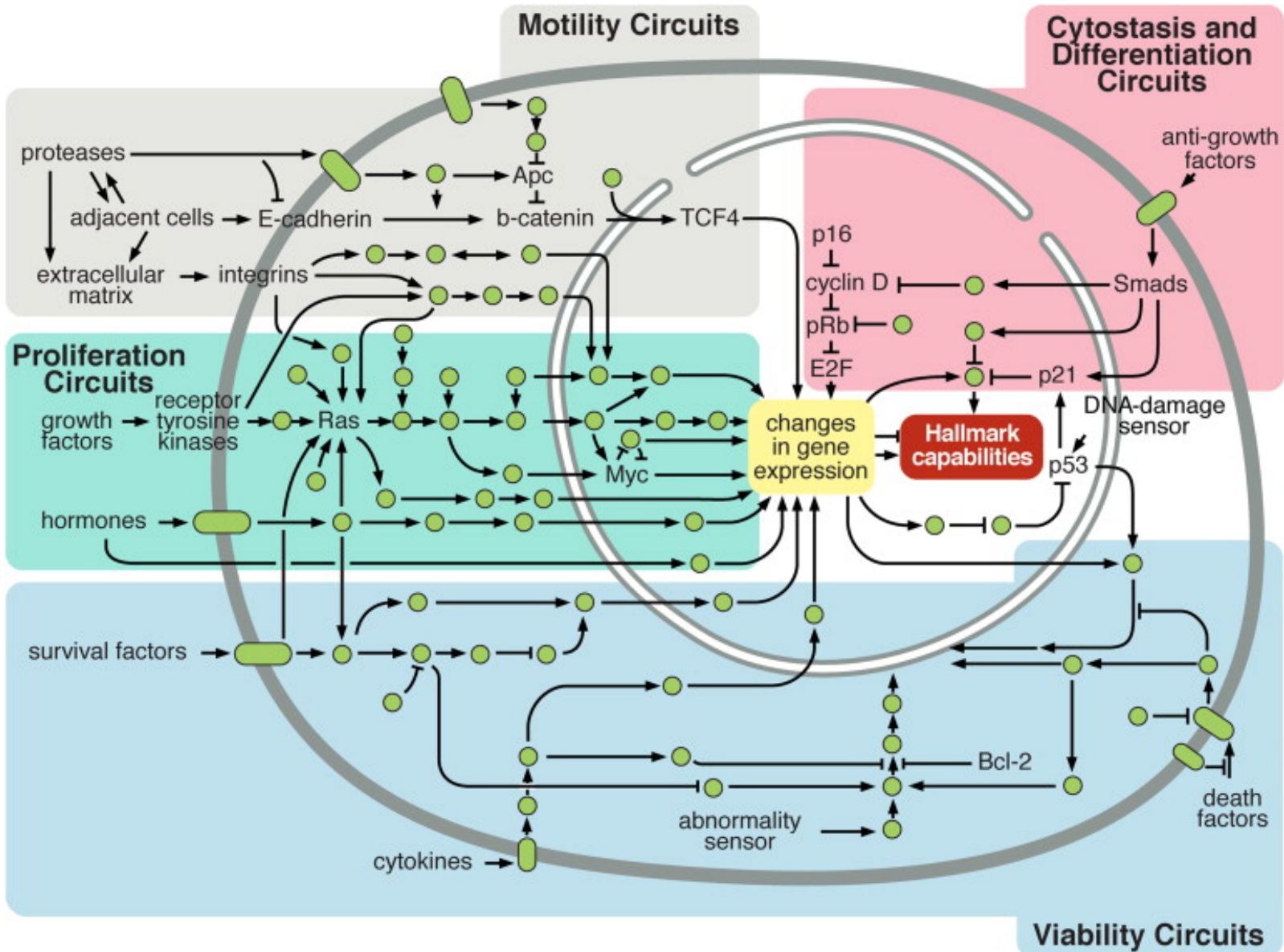
From van't Veer et al.,
“Gene expression
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Expression Subtype Reflects the Genetic Basis of the Tumor



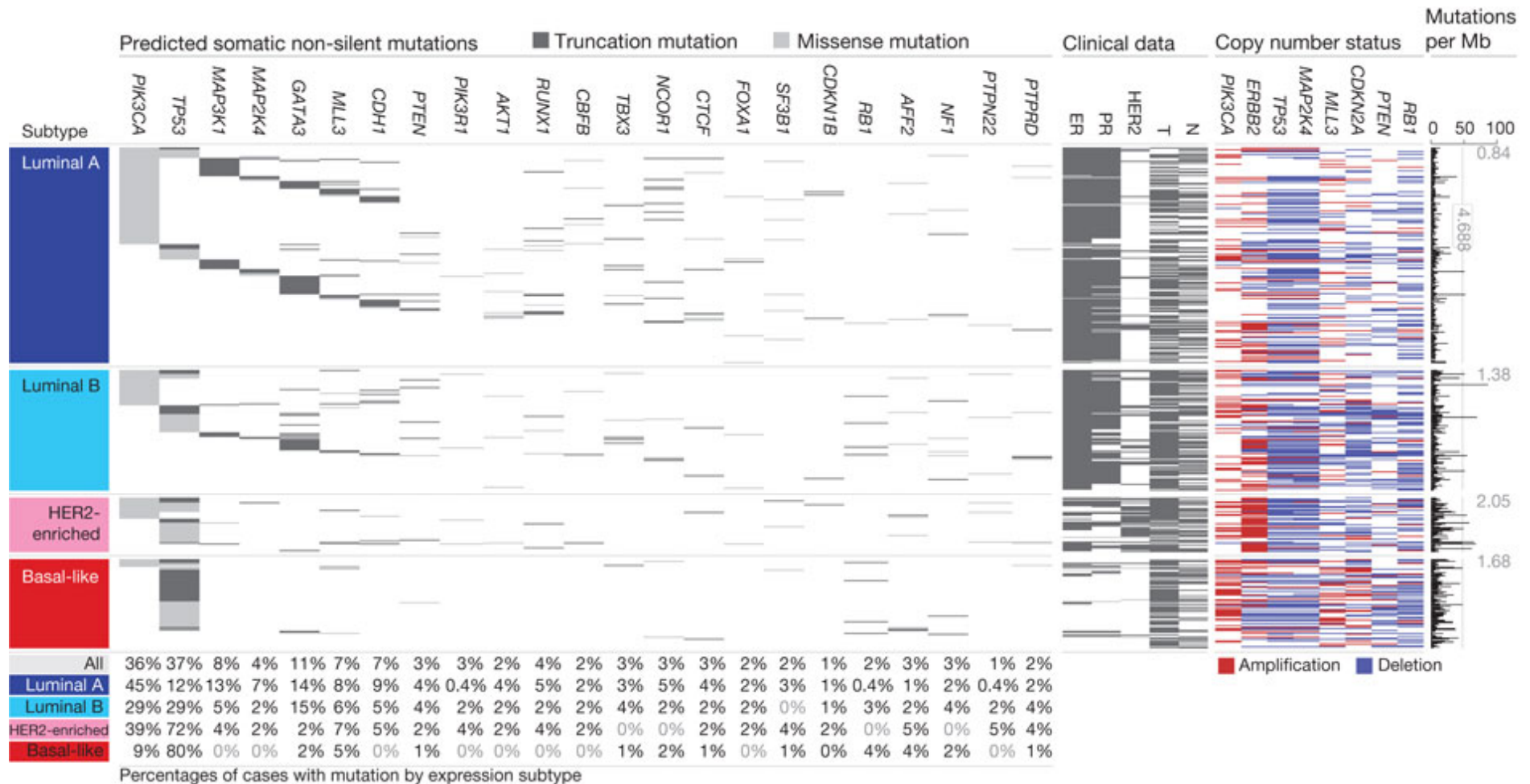
From van't Veer et al.,
“Gene expression
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415:530-536, 2001.

Interaction Networks Revisited



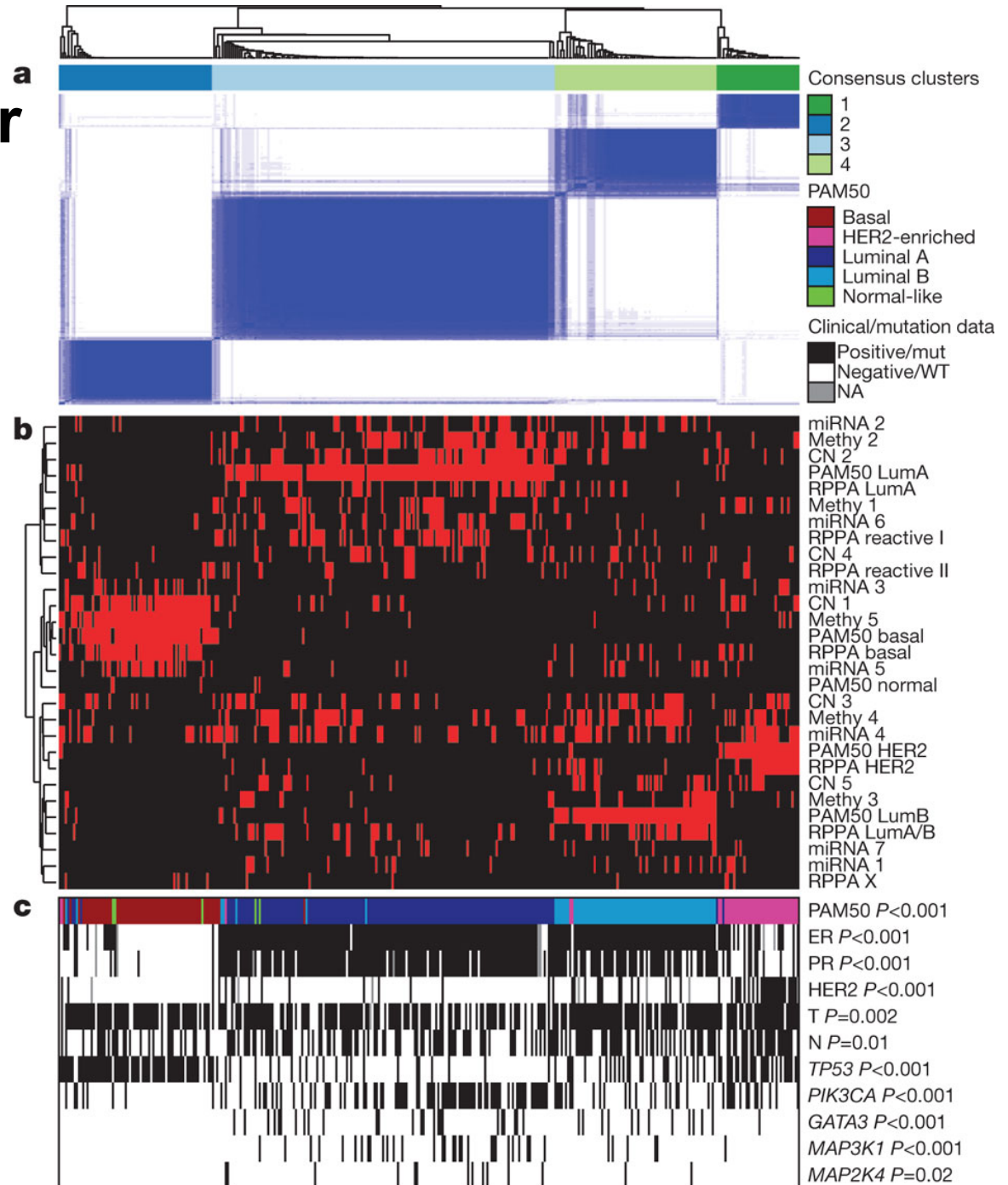
From: Hanahan and Weinberg, "Hallmarks of Cancer: The Next Generation." *Cell* 144(5):646-674, 2011.

Example: TCGA Profiles of Breast Cancers



From: The Cancer Genome Atlas Network. "Comprehensive molecular portraits of human breast tumors." Nature. 490:61-70, 2012.

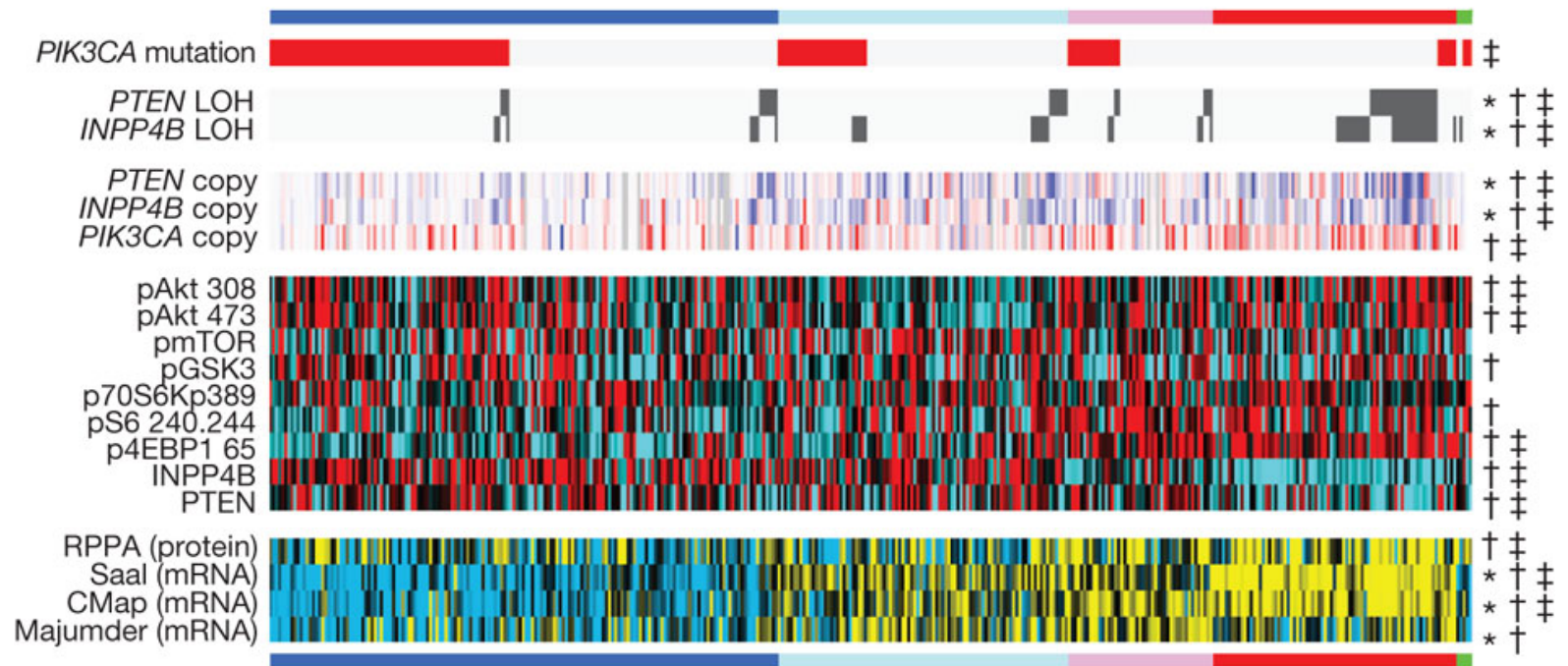
Refining Tumor Subtypes



From: The Cancer Genome Atlas Network.
 "Comprehensive molecular portraits of
 human breast tumors." Nature.
 490:61-70, 2012.

Diversities of Mutations Can Contribute to Common Functional Outcomes

a PI(3)K pathway (390 tumours with mRNA/mutation/protein data)

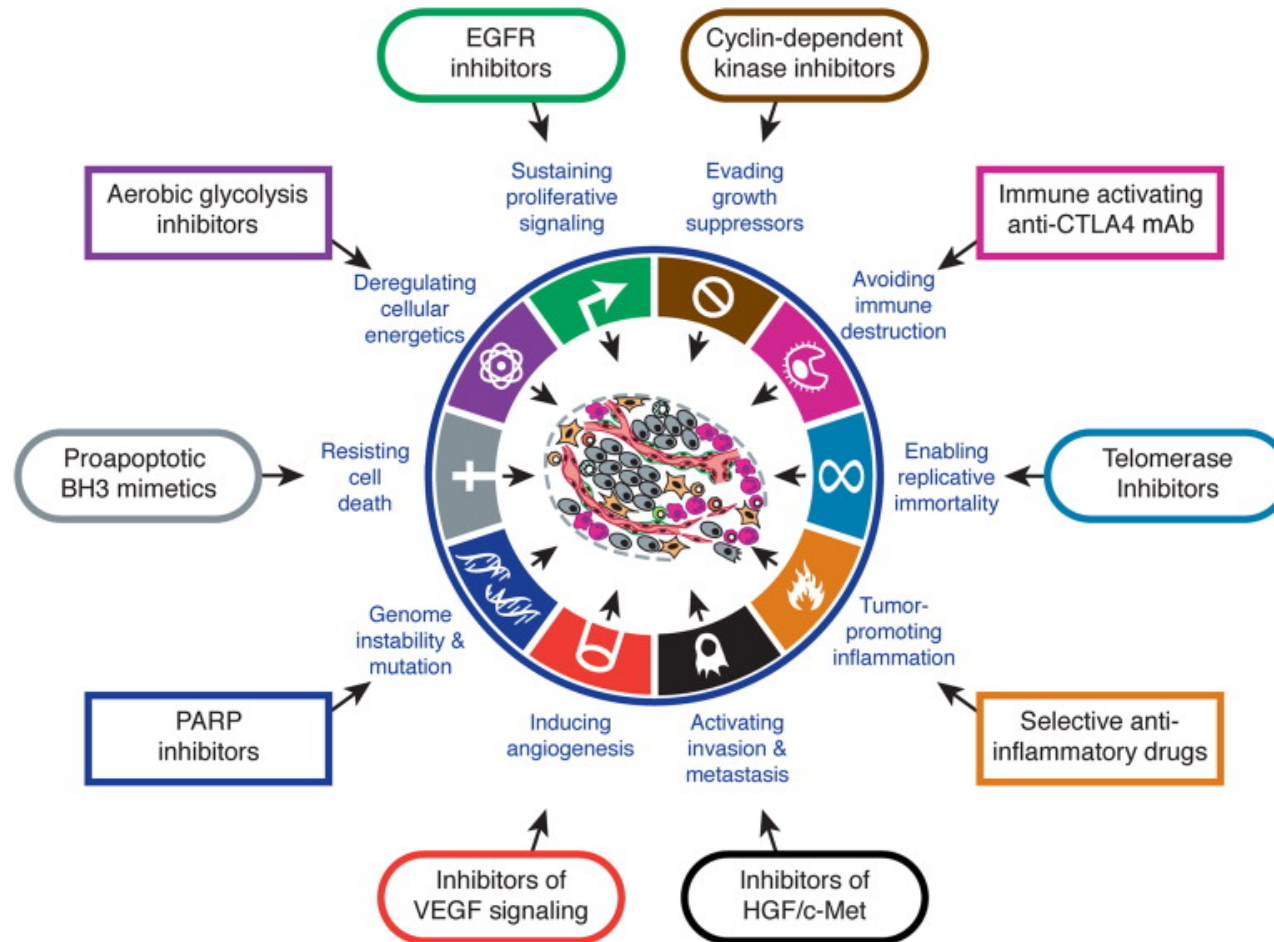


* Correlated with PI(3)K protein signature ($P < 0.0005$)
 † Differences by PTEN/INPP4B LOH ($P < 0.05$)
 ‡ Differences by basal subtype vs others ($P < 0.01$)

Copy change mRNA expression Protein expression Gene signature activity
 Loss ■ ■ Gain Low ■ ■ ■ High Low ■ ■ ■ High Less ■ ■ ■ More
 mRNA subtype: Luminal A ■ Luminal B ■ HER2-enriched ■ Basal-like ■ Normal-like ■

From: The Cancer Genome Atlas Network. "Comprehensive molecular portraits of human breast tumors." Nature. 490:61-70, 2012.

Understanding Cancer Genetics Help Us Develop New Therapies



From: Hanahan and Weinberg, "Hallmarks of Cancer: The Next Generation." Cell 144(5):646-674, 2011.

Genomic Signatures are Now Part of Cancer Diagnosis and Treatment

- Many expression signatures now available for different tumor types
- Often available as standard assays for cancer patients (e.g., Oncotype DX signature for breast cancers)
- Can help guide prognosis and treatment of cancers

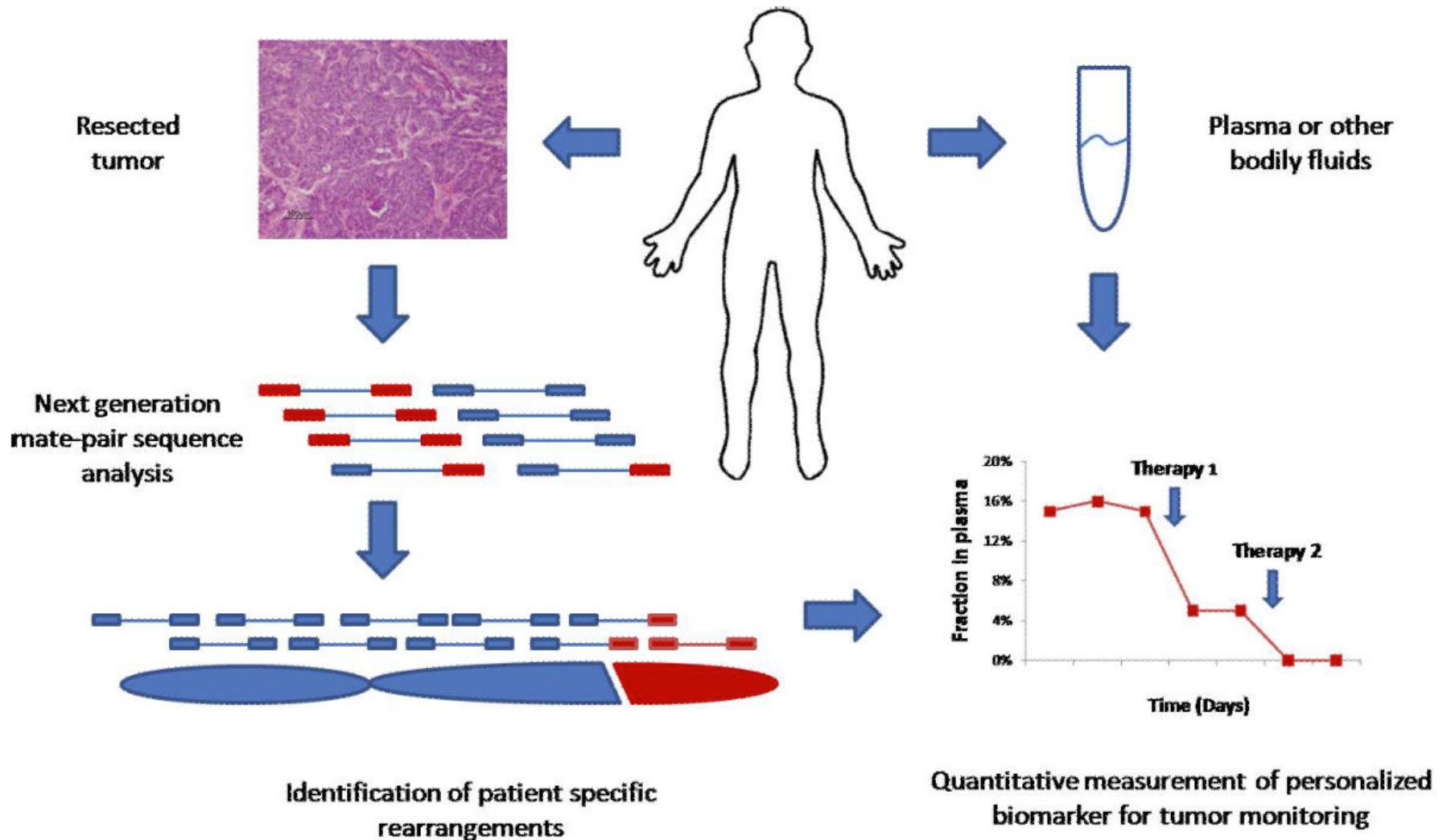
Examples of Targeted Therapeutics for Cancer

Therapeutic	Brand Name	Application
trastuzumab	Herceptin	Her-2 positive breast cancer
imatinib mesylate	Gleevec	chronic myeloid leukemia, gastrointestinal stromal tumors
bevacizumab	Avastin	metastatic colorectal cancer, non- small cell lung cancer, Her-2 negative breast cancer
cetuximab	Erbitux	colorectal cancer
gefitinib	Iressa	non-small-cell lung cancer
erlotinib	Tarceva	non-small-cell lung cancer, pancreatic cancer

From Targeted Therapy to Personalized Therapy

- Many patients do not fit neatly into a subtype and there are many variations within each one
- Drugs that help for a subtype in general do not help every patient in that subtype
- Many subtypes probably not yet recognized or too rare to be selectively targeted
- Every tumor is, to some degree, unique at the genetic level

Bringing Personalized Therapy to Normal Treatment Practice



From: Leary et al. "Development of Personalized Tumor Biomarkers using Massively Parallel Sequencing." *Sci Transl Medicine*. 2(20): 20ra14.

An Anecdote: Lukas Wartman

Diagnosed with lymphoblastic leukemia; after failing to respond to standard treatment, prognosis was hopeless .



Dr. Wartman happened to be a leukemia researcher; a team of colleagues decided to use him as a case study for personalized cancer treatment.



Genome/transcriptome completely sequenced and assembled in tumor and normal cells; computationally analyzed to find the specific cause of his cancer.



He turned out to have a strongly overexpressed gene: FLT3. FLT3 was not a known cause of leukemia, but it was a known cause of kidney cancer.



Dr. Wartman responded to a targeted therapeutic for FLT3-based kidney cancer and his cancer went into remission.

Reported in Kolata, "In Treatment for Leukemia, Glimpses of the Future." New York Times, July 7, 2012.

Wartman's Experience is Not a Model for Most Patients (Yet)

- Sequencing still too slow and expensive for routine use
- Vast amounts of computing power required to process the data fast enough to put it in a usable form
- A team of experts needed to analyze and discuss the data to draw useful inferences from it
- But ... sequencing is getting cheaper, computers are getting faster, and computational biology is getting better at automating these inferences

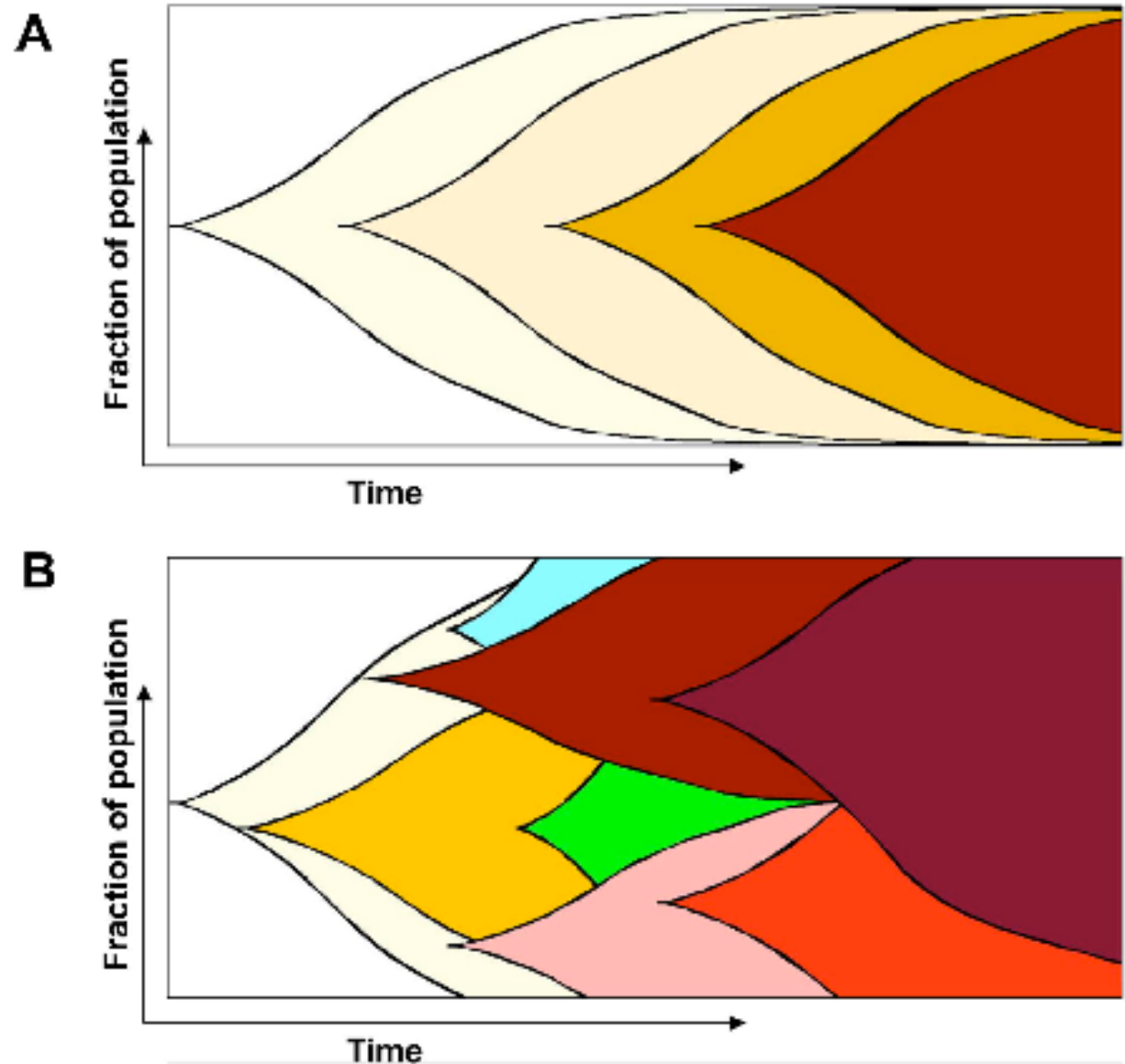
Overview

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The Problem of Tumor Complexity

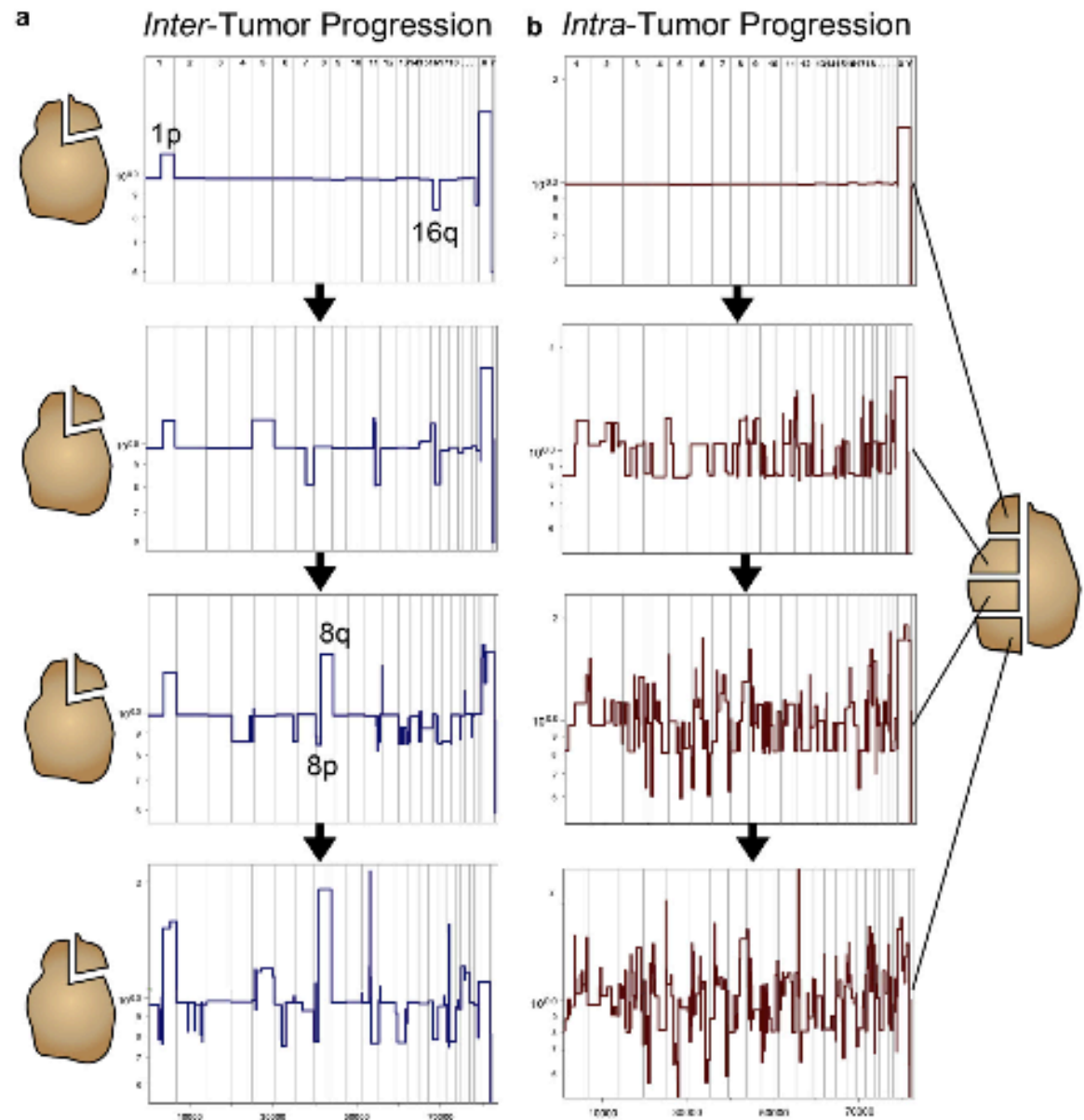
- The tumor genome varies from cell to cell: different cells have different combinations of mutations
- The tumor genome varies from day to day: tumors continue to evolve over time
- This has important implications for treatment: especially drug resistance

Why Does It Matter?: Heterogeneity and Evolution



From: Marusyk and Polyak.
“Tumor heterogeneity: Causes and consequences.” *Biochim Biophys Acta*. 1805(1): 105, 2010.

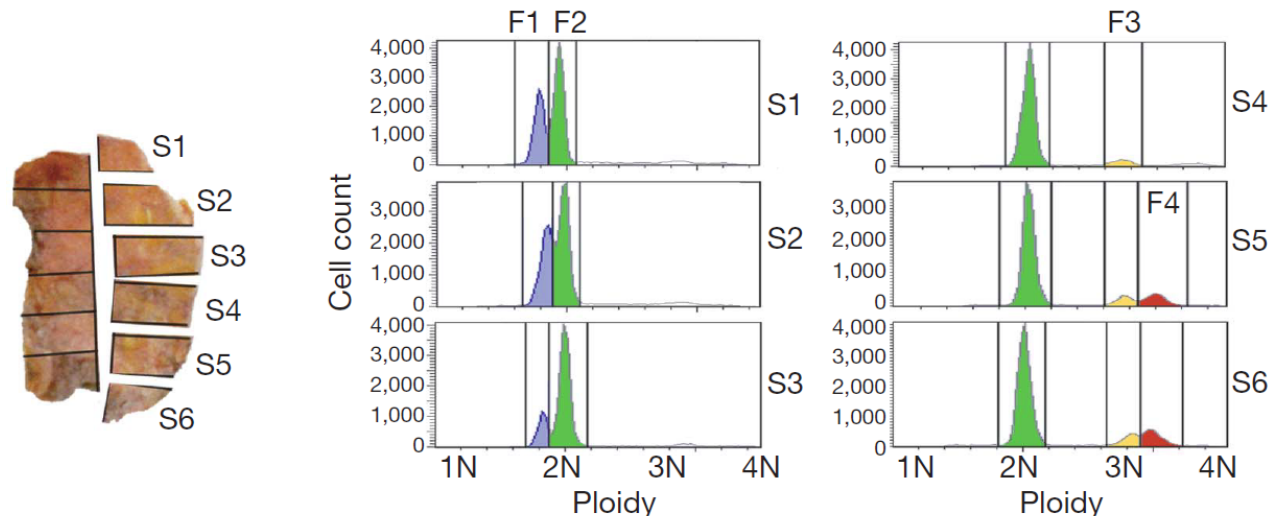
Characterizing Intra-tumor Genomic Heterogeneity at the Single-Cell Level



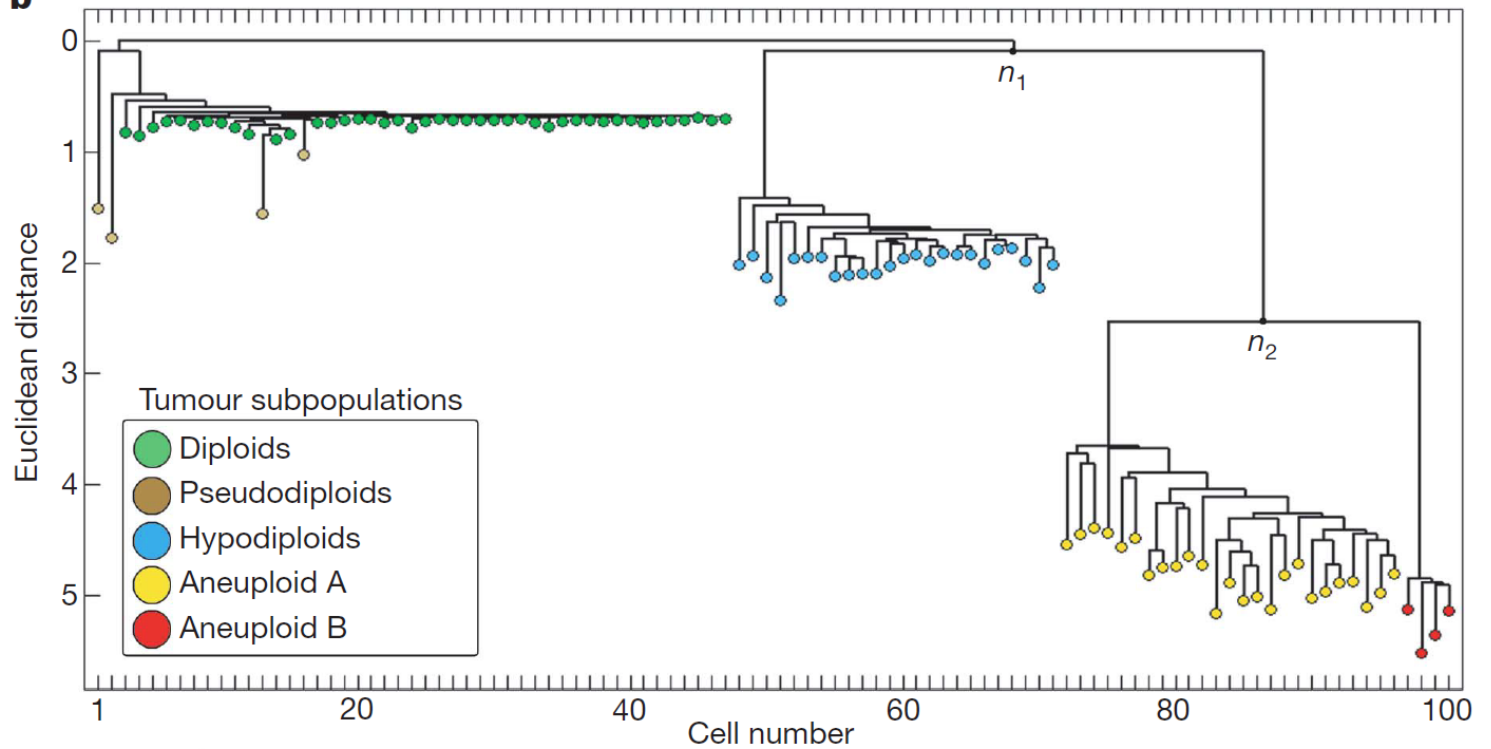
From Navin et al. "Tumor evolution inferred by single-cell sequencing." *Nature*. 472:90-94, 2011.

Tumor Phylogenetics

a



b



From Navin et al.
 “Tumor evolution
 inferred by single-
 cell sequencing.”
 Nature.
 472:90-94, 2011.

The State of the Art of Genomic Medicine for Cancer Therapy

The Good News

- Diagnostics and therapeutics based on tumor sub-types are now part of routine cancer treatment
- Many inherited mutations for tumor risk are known, some routinely used in treatment
- We have the knowledge to do much better for cancer treatment

The Bad News

- Truly personalized cancer treatment remains out of reach for most people; too costly and labor-intensive
- Tumor evolution is an unsolved problem; it is often only a matter of time before a tumor evolves to resist treatment

Challenges to Cancer Genome Analysis

- Somatic mutation calling is more challenging
 - the impurity of the sample
 - Normal genomes have allele copies of 0, 1, or 2
 - Cancer genomes can have allele copies of fractions of 0, 1, or 2
 - Most somatic mutations are rare
- Sequence alignment and assembly can be significantly more challenging because of highly rearranged chromosomes and high variation across cancer genomes
- Different cancer types have different rates of mutations. Mutator phenotype may or may not present.
- Infrequently occurring driver mutations are hard to identify.

Summary

- The genetic causes of cancer include both heritable germline mutations and somatic mutations
- The key challenge in studying the genetic causes of cancer is to identify driver mutations from background passenger mutations
- From cancer genomic data, we can learn subtype information that can be used for personalized therapy
- Tumor heterogeneity can be examined from single-cell sequencing